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//
        FILE:
                Emb_b_w.cpp
        FUNCTIONALITY: class Embedded Training implementation
        PROGRAM: adding new files in database
//
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        DATA FIRST VERSION: 02/15/00
//
//
//
#include "Emb_b_w.h"
//LogAdd: Return sum x + y on log scale, sum < LOGSMALL is floored to LZERO
static t_real LogAdd(t_real x, t_real y)
        t_real temp;
        if(x<y)
                temp = x;
                x = y;
                y = temp;
        temp = y-x;
        if(temp<MINLOGEXP)</pre>
                if(x<LOGSMALL)
                         return LOGZERO;
                else return x;
        else return x+log((t_real)1.0+ exp(temp));
        }
//
                        Statistics Accumulators
//
void StatisticsAccumulators::Configure(const t_index num_states_of_symbol,
                                 const t_index num_mixes_of_symbol, const
t_index obs_size,
```

const Boolean full_covs)

```
t_index j, k;
        num_istances = 0;
        num_states = num_states_of_symbol;
        num_mixes = num_mixes_of_symbol;
        tran.Destroy_And_ReDim(num_states, num_states);
        occ.Destroy_And_ReDim(num_states);
        mu.Destroy_And_ReDim(num_states);
        for(j=0;j<num_states;j++)</pre>
                 mu[j].Destroy_And_ReDim(num_mixes);
                 for(k=0; k<num_mixes; k++)</pre>
                         mu[j][k].Destroy_And_ReDim(obs_size);
                 }
        if(full_covs)
                 full_cov.Destroy_And_ReDim(num_states);
                 for(j=0;j<num_states;j++)</pre>
                          full_cov[j].Destroy_And_ReDim(num_mixes);
                          for(k=0; k<num_mixes; k++)</pre>
                                  full_cov[j][k].Destroy_And_ReDim(obs_size,
obs_size);
                                  }
                         }
                 }
        else{
                 diag_va.Destroy_And_ReDim(num_states);
                 for(j=0;j<num_states;j++)</pre>
                         diag_va[j].Destroy_And_ReDim(num_mixes);
                         for(k=0; k<num_mixes; k++)</pre>
                                  diag_va[j][k].Destroy_And_ReDim(obs_size);
                         }
                 }
        c.Destroy_And_ReDim(num_states, num_mixes);
        return;
```

```
}
void StatisticsAccumulators::Reset_Parameters()
        t_index j, k;
        num_istances = 0;
        tran.Set(0.0);
        occ.Set(0.0);
        for(j=0;j<num_states;j++)</pre>
                 for(k=0; k<num_mixes; k++)</pre>
                         mu[j][k].Set(0.0);
        if(full_cov.Dim()>0)
                 for(j=0;j<num_states;j++)</pre>
                          for(k=0; k<num_mixes; k++)</pre>
                                  full_cov[j][k].Set(0.0);
        else for(j=0;j<num_states;j++)</pre>
                          for(k=0; k<num_mixes; k++)</pre>
                                  diag_va[j][k].Set(0.0);
        c.Set(0.0);
        return;
        }
//
//
                                  REESTIMATE
                                                   MODELS PARAMETERS
//
//
                          UNTIL THE DESIRED CONVERGENCE VALUE IS REACHED
Boolean ModelsSimultaneousTraining::Symbol_Models_Optimisation()
        t_real average_likelyhood;
        t_index iteration_counter = 0, i;
        ofstream file;
        file.open("likelyhood.int");
        file.close();
        if(load_accs)
                 Update_Models();
```

```
else{
                mstat<<"Start parameter reestimation cycle.";</pre>
                 do
                         {
                         for(i=0;i<HMM_accs.Dim();i++)</pre>
                                  HMM_accs[i].Reset_Parameters();
                         ReEstimate_Parameters(average_likelyhood, dbase);
                         Update_Models();
                         iteration_counter++;
                         file.open("likelyhood.int",ios::app);
                         file<<"Average likelyhood at iteration
"<<iteration_counter
                                   <<":"<<average_likelyhood<<"\n";
                         file.close();
                         Store_Iteration_Model(iteration_counter);
                         dbase.Restart();
                         } while(iteration_counter<max_num_iteration);</pre>
                mstat<<"Training set likelyhood: "<<average_likelyhood;</pre>
                 }
                 file.close();
                 if(store_accs)
                         Store_Statistic_Accs(accs_file);
                 return (Boolean)TRUE;
        }
void ModelsSimultaneousTraining::Store_HMM_Models()
        {
        t_index symb;
        String f_name;
        for(symb=0; symb<+HMM_defs.Dim(); symb++)</pre>
                 HMM_defs[symb].Write(models_file_output);
        return;
        };
void ModelsSimultaneousTraining::Store_Iteration_Model(t_index iteration)
        t_index symb;
        ofstream file;
```

```
String f_name;
        f_name<<"iteration_"<<iteration<<".emb";
                file.open(f_name);
        Write_Header_Of_File_Model(f_name,
                                               dbase.Snd_Type(),
                dbase.Label_Type(), dbase.Db_File_List_Name
(), dbase.Window_Lenght(),
                dbase.Window_Overlap(), 39, FALSE);
        file.close();
        for(symb=0; symb<HMM_defs.Dim(); symb++)</pre>
                HMM_defs[symb].Write(f_name);
        return;
// Init_Emb_Train: initialise dbase, training structures and load models.
void ModelsSimultaneousTraining::Configure(const String& config_file)
        ConfigFile conf;
        t_index symb_num, position;
        features.Configure(config_file);
        dbase.Configure(config_file, TRUE);
        symb_num=dbase.Get_Num_Of_Symbols();
        conf.Open_File(config_file);
        conf.Get_String_Opt("ModelsSimultaneousTraining", "modelsfilename",
models_file_input);
        max_num_iteration = conf.Get_Unsigned_Opt
("ModelsSimultaneousTraining", "MaxNumIteration");
        reest_means=conf.Get_Boolean_Opt("ModelsSimultaneousTraining",
"ReestimateMeans");
        reest_variances = conf.Get_Boolean_Opt
("ModelsSimultaneousTraining", "ReestimateVariances");
        reest_weights
                        = conf.Get_Boolean_Opt
("ModelsSimultaneousTraining", "ReestimateWeights");
        reest_transitions =
                                conf.Get_Boolean_Opt
("ModelsSimultaneousTraining", "ReestimateTransitions");
        min_istance_number = conf.Get_Unsigned_Opt
```

```
("ModelsSimultaneousTraining", "MinIstanceNumber");
        pruning_threshold = conf.Get_Real_Opt("ModelsSimultaneousTrainina".
"PruningThreshold");
        min_var_value = conf.Get_Real_Opt("ModelsSimultaneousTraining",
"MinimunVarianceValueIfDiagonal");
        const_to_add_min_var= conf.Get_Real_Opt
("ModelsSimultaneousTraining", "ConstToAddMinVar");
        load_accs = conf.Get_Boolean_Opt("ModelsSimultaneousTraining",
"LoadAccumulators");
        if(load_accs)
                conf.Get_String_Opt("ModelsSimultaneousTraining",
"AccsList", list_file);
        store_accs = conf.Get_Boolean_Opt("ModelsSimultaneousTraining",
"StoreAccumulators");
        if(store_accs)
                conf.Get_String_Opt("ModelsSimultaneousTraining",
"AccsFile", accs_file);
        models_file_input.Is_SubString_Inside(".", position);
        models_file_output.Destroy_And_ReDim(position);
        models_file_output.Take(models_file_input.0.position);
        models_file_output<<"emb";</pre>
        HMM_defs.Destroy_And_ReDim(symb_num);
        Load_Models_Parameters();
        if(load_accs)
                {
                ifstream file_list;
                String file_name;
                file_list.open(list_file, ios::inlios::nocreate);
                if(file_list.fail())
                        merr<<"Cannot open file of list of statistics
accumulators";
                while(!file_list.eof())
                        file_list>>file_name;
                        if(file_list.eof() AND file_name[0]==EOF)
                                 return;
            Load_Statistic_Accs(file_name);
                        }
                }
```

```
return;
       };
//
//
                                            REESTIMATE PARAMETRS
//
sequences_lprob)
       {
       t_real temp;
       t_index i;
       temp = sequences_lprob[0];
       for(i=1;i<sequences_lprob.Dim();i++)</pre>
              temp+=sequences_lprob[i];
       return temp;
       };
void ModelsSimultaneousTraining::ReEstimate_Parameters(t_real&
training_set_likelyhood,
                                DbaseVoc& dbase)
       Boolean not_end_of_dbase, is_new_file;
       t_index i, file_counter;
       VetDouble vetsmp;
       t_string_list label_list;
       t_real sequence_lprob;
   VetDouble sequences_lprob;
       static VetDouble observation_vet;
       VetDoubleList pred_list;
       T = 0;
       not_end_of_dbase = (Boolean)TRUE;
       pred_list.Destroy_And_ReDim(features.Max_Delta_Feature_Order());
       while(not_end_of_dbase)
               {
```

```
// indicating in "is_new_ file" if it is the first frame of
а
                // new sentence and the condition "not_end_of_dbase"
                not_end_of_dbase=dbase.Get_Sequential_Vet(vetsmp,
is_new_file);
                if( (T!=0) AND (is_new_file==TRUE OR
not_end_of_dbase==FALSE ) )
                // i.e. if an file has been read
                         {
                        // TRAINING STEP: apply forward-backward procedure
                        //
                               to given file and update parameter
accumulators
                        Assert(T == file.Dim());
                sequence_lprob = Update_Parameters_With_New_file(file,
                                         label_idxes_list);
                         sequences_lprob.Append(sequence_lprob);
                         file.Reset();
                        cout<<"file_num: "<<sequences_lprob.Dim()<<'\t';</pre>
                         cout<<"num frames: "<<T<<endl;</pre>
                        T=0;
                         }
                if ( not_end_of_dbase )
                         if(is_new_file)
                             dbase.Get_Label_List_Of_Actual_file
(label_idxes_list);
                                 Q = label_idxes_list.Dim();
                                 for(i=0;i<pred_list.Dim();i++)</pre>
                                         // just a little trick: starting
frames initialized with
                                         // the value of the first frame: in
order to have a starting value
                                         pred_list[i] = vetsmp;
                                 features.Get_Previous_Frames_Info
(pred_list, dbase.Smp_Rate());
                                 }
                         features.Extract(observation_vet, vetsmp,
dbase.Smp_Rate());
                        // memorize in file the samples of the next file
                        // of training data
```

```
file.Append(observation_vet);
                        T++;
                        }
               } // end while
        file_counter = sequences_lprob.Dim();
        training_set_likelyhood = Sequences_Total_LProb(sequences_lprob)/
(t_real)file_counter;
    return;
       };
t_real ModelsSimultaneousTraining::Update_Parameters_With_New_file
                                (const Bi_D_List& file, const VetULong&
label_idxes_list)
        t_index q, t, startq, endq;
        t_real file_lprob;
        VetDouble obs;
                                               // observation vector
        VetULong top_label;
                                               // top of pruning beam
        VetULong bottom_label;
                                     // bottom of pruning beam
        file_lprob = Compute_Beta(top_label, bottom_label, file,
label_idxes_list);
       if (file_lprob > LOGZERO)
                                  // if models fit current file
                {
                //alfa computation and parameters updating
                //performed only if model fits actual file
                Init_Alpha(label_idxes_list);
                //update occurrence counters of the HMMs
                for (q=0; q<0; q++)
                         HMM_accs[label_idxes_list[q]].num_istances++;
                //for all frames
                for (t=0;t<T;t++)
                        Get_Observation(obs, file, t);
                        if (t>0)
                                 Compute_Alpha_At_Time_t(startq, endq,
file_lprob, top_label,
```

```
bottom_label, t, label_idxes_list);
                        else startq = endq = 0;
                        // update parameters only on a significant sequence
                        // ( starting at label no. startq and ending at
label enda)
                        // of labels inside the actual file
                        for (q=startq;q<=endq;q++)</pre>
                                Update_Occourrence_Counter(HMM_accs
[label_idxes_list[q]], t,q, file_lprob);
                                if (reest_means OR reest_variances OR
reest_weights)
                                         // HMM_defs[label_list[q]] is the
hmm
                                         // of the q-th labelof the file
                                          Up_Mix_Parms(HMM_defs
[label_idxes_list[q]], HMM_accs[label_idxes_list[q]],
                                                                 q, t, obs,
file_lprob);
                                 if (reest_transitions)
                                         Up_Tran_Parms(HMM_defs
[label_idxes_list[q]], HMM_accs[label_idxes_list[q]],
                                                         file_lprob, q, Q,
t, T);
                                } // endfor q
                        } // endfor t
                }// end if
        return file_lprob;
        }
// InitPruneStats: initialise pruning stats
void ModelsSimultaneousTraining::Init_Prune_Stats()
        maxBeamWidth = 0;
        maxAlphaBeta = LOGZERO;
        minAlphaBeta = 1.0;
        }
// CheckPruning: record peak alfa.beta product and position
void ModelsSimultaneousTraining::CheckPruning(t_index t, const t_index
```

```
beam_top, const t_index beam_bottom,
                EmbCodebook& act_hmm)
        {
        t_signed margin;
        t_index i, q, bestq, besti, Nq;
        t_real l, maxL;
        bestq = besti = 0;
        maxL = LOGZERO;
        for (q=beam_bottom ; q<=beam_top ; q++)</pre>
                Nq = act_hmm.num_states;
                for (i=1; i<Nq-1; i++)
                         if((l=act_alfa[q][i] + beta[q][t][i]) > maxL)
                                 {
                                 bestq = q;
                                 besti = i;
                                 maxL=1;
                                 }
                         }
        if (maxL > maxAlphaBeta)
                maxAlphaBeta = maxL;
        if (maxL < minAlphaBeta)</pre>
                minAlphaBeta = maxL;
        margin = beam_top-beam_bottom+1;
        if (margin>maxBeamWidth)
                maxBeamWidth = margin;
        }
// CreateInsts: create array of hmm instances indexes
void ModelsSimultaneousTraining::Create_Insts(VetULong& label_idxes_list,
const t_string_list& label_list, DbaseVoc& dbase)
        t_index q;
        label_idxes_list.Destroy_And_ReDim(label_list.Dim());
        for (q=0;q<label_list.Dim();q++)</pre>
                label_idxes_list[q] = dbase.Translate_Symbol(label_list
[q]);
        return;
```

```
// SetBeta: allocate and calculate beta and otprob matrices
t_real ModelsSimultaneousTraining::Compute_Beta(VetULong& qHi, VetULong&
qLo,
                                                 const Bi_D_List&
whole_file, const VetULong& label_idxes_list)
        t_index t,q:
        t_index i, j, Nq, q_at_gMax, startq, endq, last_q;
        VetDouble bqt,bqt1,outprob,maxP;
        t_real x, a, y, gMax, lMax;
        EmbCodebook *act_HMM;
        t_real pr;
        // Create Storage Space - excluding actual data arrays
        // storage for min and max a values
        qHi.Destroy_And_ReDim(T);
        qLo.Destroy_And_ReDim(T);
        // dimensionate beta and obs_lprob
        beta.Destroy_And_ReDim(0);
        obs_lprob.Destroy_And_ReDim(Q);
        for(q=0;q<0;q++)
                {
                beta[q].Destroy_And_ReDim(T);
                obs_lprob[q].Destroy_And_ReDim(T);
        maxP.Destroy_And_ReDim(Q);
                                                         // for calculating
beam width
        act_HMM = &HMM_defs[label_idxes_list[Q-1]];
        Nq = act_HMM->num_states;
        beta[Q-1][T-1].Destroy_And_ReDim(Nq);
        beta[Q-1][T-1][Nq-1]=0.0;
        for (i=1; i<Nq-1; i++)
                beta[Q-1][T-1][i] = act_HMM->trans_mat[i][Nq-1];
        beta[Q-1][T-1][0]=LOGZERO;
        qHi[T-1] = qLo[T-1] = Q-1;
        Compute_Obs_LProbs(whole_file[T-1], T-1, qHi[T-1],
                qLo[T-1], label_idxes_list);
        Assert(T>=2);
```

```
for (t=T-2;t!=(t_index)(-1);t--)
                gMax = LOGZERO; // max value of beta at time t
                if(t>=qHi[t+1]) startq=qHi[t+1];
                else startq = t;
                if (0==qLo[t+1]) endq = 0;
                else endq = qLo[t+1]-1;
                Assert(startq>=endq);
                for (q=startq;q!=(t_index)(endq-1);q--)
                        lMax = LOGZERO; // max value of beta in model a
                        act_HMM = &HMM_defs[label_idxes_list[q]];
                        Nq = act_HMM->num_states;
                        // create vec for beta vals
                        beta[q][t].Destroy_And_ReDim(Nq);
                        outprob = obs_lprob[q][t+1];
                        if (q==startq) beta[q][t][Nq-1]= LOGZERO;
                        else beta[q][t][Nq-1]= beta[q+1][t][0];
                        Assert(Nq>=2);
                        for (i=Nq-2;i!=(t_index)(-1);i--)
                x = act_HMM - strans_mat[i][Nq-1] + beta[q][t][Nq-1];
                                if (q>=qLo[t+1] AND q<=qHi[t+1])
                                         for (j=1; j<Nq-1; j++)
                                                 {
                        a = act_HMM->trans_mat[i][j];
                                                 y = beta[q][t+1][j];
                                                 if (a>LOGSMALL AND
y>LOGSMALL)
                                                         x = LogAdd(x,a)
+outprob[j]+y);
                                                 } // endfor j
                                 beta[q][t][i] = x;
                                 if (x>1Max) 1Max = x;
                                 if (x>gMax)
                                         {
                                         gMax = x;
                                         q_at_gMax = q;
                                } // endfor i
                        maxP[q] = lMax;
```

```
} // endfor q
                last_q = endq;
                while (gMax-maxP[startq] > pruning_threshold)
                                     // lower startq till threshold
                         starta-=1;
reached
                qHi[t] = startq;
                while ( ((gMax-maxP[endq]) > pruning_threshold) AND endq<t)</pre>
                                       // raise endq till thresh reached
                qLo[t] = endq;
                Compute_Obs_LProbs(whole_file[t], t, qHi[t], qLo[t],
label_idxes_list);
                } // endfor t
        // compute total probability pr
        pr = LOGZERO;
        outprob = obs_lprob[0][0];
        for (j=1; j<Nq-1; j++)
                a = act_HMM->trans_mat[0][j];
                y = beta[last_q][0][j];
                if ( (a>LOGSMALL) AND (y>LOGSMALL) )
                         pr = LogAdd(pr,a+outprob[j]+y);
                }
        if (LOGZERO >= pr)
                mwarn<<"Prune threshold = "<<pre>runing_threshold<<" too</pre>
small.";
                return pr;
        return pr;
// Setotprob: allocate and calculate otprob matrix at time t
void ModelsSimultaneousTraining::Compute_Obs_LProbs(const VetDouble& obs,
                                  const t_index t, const t_index beam_top,
                                  const t_index beam_bottom, const VetULong&
label_idxes_list)
        t_signed q;
        t_index j, Nq, endq;
```

```
VetDouble temp_dvet;
        EmbCodebook *act_HMM;
        if (0==beam\_bottom) end = 0;
        else endq = beam_bottom-1;
        for (q=beam_top; q>=(t_signed)endq; q--)
                act_HMM = &HMM_defs[label_idxes_list[q]];
                Nq = act_HMM->num_states;
                obs_lprob[q][t].Destroy_And_ReDim(Nq-1);
                for (j=1; j<Nq-1; j++)
                        obs_lprob[q][t][j]=(*act_HMM)[j-1].0bs_LProb(obs);
        return ;
        }
//
11
//
                                ALPHA MATRIX
//
// InitAlpha: allocate and initialise alfa columns for time t=1
void ModelsSimultaneousTraining::Init_Alpha(const VetULong&
label_idxes_list)
        t_index i,j,q, Nq;
        VetDouble aq, outprob;
        EmbCodebook *act_HMM;
        t_real x;
        // Create Storage Space - two columns
        act_alfa.Destroy_And_ReDim(Q);
        prev_alfa.Destroy_And_ReDim(Q);
        for(q=0;q<Q;q++)
                {
                Nq = HMM_defs[label_idxes_list[q]].num_states;
                act_alfa[q].Destroy_And_ReDim(Nq);
                act_alfa[q].Set(LOGZERO); // initialize act_alfa to
LOGZERO
```

```
prev_alfa[q].Destroy_And_ReDim(Nq);
        // Calculate prev_alfa (alfat) values for t=0
        act_HMM = &HMM_defs[label_idxes_list[0]];
        Nq = act_HMM->num_states;
        act_alfa[0][0] = LOGZERO;
        if(obs_lprob[0][0].Dim()==0)
                merr<<"No observation prob matrix at time t=0.";
        for (j=1; j<Nq-1; j++)
                if (act_HMM->trans_mat[0][j]>LOGSMALL)
                        act_alfa[0][j] = obs_lprob[0][0][j]+act_HMM-
>trans_mat[0][j];
                else act_alfa[0][j] = LOGZERO;
        x = LOGZERO;
        for (i=1; i<Nq-1; i++)
                if (act_HMM->trans_mat[i][Nq-1]>LOGSMALL)
                        x = LogAdd(x, act_alfa[0][i] + act_HMM->trans_mat
[i][Nq-1]);
        act_alfa[1][0] = x;
        Zero_Alpha(1,Q-1, label_idxes_list);
        return;
        }
// StepAlpha: calculate alfat column for time t and return
// forward beam limits in starta and enda
//
     for first opbservation startq = endq=0
     startq and endq must be passed by reference to update their value
void ModelsSimultaneousTraining::Compute_Alpha_At_Time_t(t_index& startq,
t_index& endq,
                                                const t_real pr, const
VetULong& qHi, const VetULong& qLo,
                                                const t_index t, const
VetULong& label_idxes_list)
        {
        Bi_D_List tmp;
        EmbCodebook *act_HMM;
    t_index i,j,q,Nq;
    t_real a,x,y;
        startq = qlo[t-1];
```

```
while (pr - MaxModelProb(startq, t-1, label_idxes_list)>MINMODELPROB)
                startq+=1;
        if (startq<qLo[t])</pre>
                startq = qLo[t];
        endq = qHi[t-1];
        while (pr - MaxModelProb(endq, t-1, label_idxes_list)>MINMODELPROB)
                endq=1;
        if (endq>qHi[t])
                endq = qHi[t];
        tmp = prev_alfa; prev_alfa = act_alfa; act_alfa = tmp;
        act_alfa[0][0] = LOGZERO;
        if (startq>0) Zero_Alpha(0, startq-1, label_idxes_list);
        // at any time the t-th column of alpha matrix is calculated only
for that
        // model states in the range [stratq; endq]; out of that range the
alfa
        // values are not meaningful
        for (q = startq; q \le endq; q++)
                act_HMM = &HMM_defs[label_idxes_list[q]];
                Nq = act_HMM->num_states;
                 if (obs_lprob[q][t].Dim() == 0)
                         merr<<"Bug outprob NULL at time t in StepAlpha.";</pre>
                 for (j=1; j<Nq-1; j++)
                         x = LOGZERO;
                         for (i=0; i<Nq-1; i++)
                                 a=act_HMM->trans_mat[i][j];
                                 y = prev_alfa[q][i];
                                 if(a>LOGSMALL AND y>LOGSMALL)
                                         x = LogAdd(x, y + a);
                         act_alfa[q][j] = x + obs_lprob[q][t][j];
                x = LOGZERO;
                 for (i=1; i<Nq-1; i++)
                         {
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```
a=(act_HMM->trans_mat[i][Nq-1]);
                        y = act_a[fa[q][i];
                        if(a>LOGSMALL AND y>LOGSMALL)
                                x = LogAdd(x,y+a);
                act_alfa[q][Nq-1] = x;
                if (q<Q-1)
                        act_a[q+1][0] = x;
        if (endq<Q-1) Zero_Alpha(endq+1,Q-1, label_idxes_list);
        return;
        }
// ZeroAlpha: zero alpha's of given models
void ModelsSimultaneousTraining::Zero_Alpha(const t_index qlo, const
t_index qhi,
                                 const VetULong& label_idxes_list)
        t_index j, q, Nq;
        // glo model - dont erase carry over
        Nq = HMM_defs[label_idxes_list[qlo]].num_states;
        for (j=1; j<Nq; j++)
                act_alfa[qlo][j] = LOGZERO;
        for (q=qlo+1;q<=qhi;q++)
                {
                // general case - all states LZERO
                Nq = HMM_defs[label_idxes_list[q]].num_states;
                for (j=0; j<Nq; j++)
                        act_alfa[q][j] = LOGZERO;
        if (qhi < Q-1)
                 act_alfa[qhi+1][0] = LOGZERO;
        return;
        }
                        END ALPHA MATRIX
// GetOutVec: Get observation vector obs
void ModelsSimultaneousTraining::Get_Observation(VetDouble& obs,
                                const Bi_D_List& whole_file, const t_index
```

```
t)
        obs = whole_file[t];
        return;
        }
// MaxModelProb: Calc max probability of being in model q at
     time t, return LOGZERO if cannot do so
t_real ModelsSimultaneousTraining::MaxModelProb(const t_index q, const
t_index t,
                                         const VetULong& label_idxes_list)
        t_real maxP,x;
    t_index Nq,i;
        maxP = LOGZERO;
        if(q<beta.Dim())</pre>
                Nq = HMM_defs[label_idxes_list[q]].num_states;
                if (beta[q][t].Dim()!=0)
                         for (i=0; i<Nq-1; i++)
                                 if ((x=act_alfa[q][i]+beta[q][t][i]) >
maxP)
                         maxP = x;
                }
        return maxP;
        } .
//
//
                FIRST (HIGHER) LEVEL FUNCTION
//
                        Update_Models
void ModelsSimultaneousTraining::Update_Models()
        t_index h, n;
```

```
// for each dbase label-> i.e. for each file
        for (h=0;h<HMM_defs.Dim();h++)</pre>
                 n = HMM_accs[h].num_istances;
                 if (n < min_istance_number )</pre>
                         {
                         mwarn<<"Insufficient training examples for model.";</pre>
                     mwarn<<"Model "<<h<<" copied: only "<<n<<" examples";</pre>
                 else{
                         Update_Model(HMM_defs[h], HMM_accs[h]);
                     mstat<<"Model "<<h<<" updated with "<<n<<" examples
\n";
                         }
                 }
        return;
        }
//
//
                         SECOND LEVEL FUNCTIONS
//
                            Update_Models
//
void ModelsSimultaneousTraining::Up_Mix_Parms(EmbCodebook& hmm,
StatisticsAccumulators& acc,
        const t_index q, const t_index t,
        const VetDouble& obs, const t_real pr)
        t_index i,j,k,kk,m,N, obs_size;
        VetDouble aqt1;
        t_real log_gamma, initx;
        t_real gamma, w, zmean,zmean1,zmean2;
        VetDouble mean;
        N = hmm.num_states;
        if(t==0) aqt1.Reset();
        else aqt1=prev_alfa[q];
```

```
for (j=1; j<N-1; j++)
                if ((t==0) AND (q==0))
                          initx = hmm.trans_mat[0][j];
                                                                   //
                 else if ((t==0) AND (q!=0))
shouldn't happen
                                 initx = LOGZERO;
                else{
                         initx = LOGZERO;
                         for (i=0; i< N-1; i++)
                                 initx = LogAdd(initx, aqt1[i] +
hmm.trans_mat[i][j]);
                 if (initx>LOGSMALL)
                         for (m=0;m<hmm[j-1].Dim();m++)</pre>
                                 w = hmm[j-1][m].weight;
                                 if (w>LMINMIX)
                                          {
                                          mean = hmm[j-1][m].mean;
                                          log_gamma = initx + w + beta[q][t]
[j];
                                         if (log_gamma>LOGSMALL)
                                                  log_gamma += hmm
[j-1].Mix_Obs_LProb(obs,m)-pr;
                                                  if (log_gamma>MINEXPARG)
                                                          gamma = exp
(log_gamma);
                                                          obs_size = acc.mu
[j][m].Dim();
                                                          for
(k=0;k<obs_size;k++)
                                                                   {
                                                                   if
(reest_means)
                                                                       acc.mu
[j][m][k]+= obs[k]*gamma;
                                                                   if
(reest_variances)
                                                                           {
                                                                           if
```

```
(!hmm.full_covariance)
        {
        zmean=obs[k]-mean[k];
        acc.diag_va[j][m][k] += (zmean*zmean*gamma);
}else
        {
                        zmean1 = obs[k]-mean[k];
                        for (kk=k;kk<obs_size;kk++)</pre>
                                 {
                         zmean2 = obs[kk]-mean[kk];
                        acc.full_cov[j][m][k][kk]+= (zmean1*zmean2*gamma);
                                 }
                                         // endfor kk
                    }
                        // endif (!hmm.Full_Cov())
                                                                          }
        // endif (reest_variances)
                                                                  // endfor k
                                                 if (reest_weights)
                                                                 acc.c[j][m]
+=gamma;
                                                 }
                                                         // if
(log_gamma>MINEXPARG)
                                         // endif (x>LOGSMALL)
                       // endfor m
            } // endfor j
        return;
        }
// UpTranParms: update the transition counters of given acc
void ModelsSimultaneousTraining::Up_Tran_Parms(const EmbCodebook& hmm,
StatisticsAccumulators& acc,
                         const t_real pr, const t_index q, const t_index Q,
                        const t_index t, const t_index T)
```

```
{
    t_index i,j,N;
        t_real gamma;
    VetDouble bqt1;
    N = hmm.num_states;
        if(t==T-1)
                bqt1.Reset();
        else bqt1 = beta[q][t+1];
    if (t<T-1)
                for (i=0;i<N-1;i++)
                       if (i==0 \text{ AND } q==0)
                                         if (t==0)
                                                gamma = act_alfa[q][j]+beta
[q][t][j]-pr;
                                                if (gamma>MINEXPARG)
acc.tran[i][j] += exp(gamma);
                                else{
                                        if (bqt1.Dim() != 0)
                                                gamma = act_alfa[q][i]
+hmm.trans_mat[i][j]+obs_lprob[q][t+1][j]+bqt1[j]-pr;
                                                if (gamma>MINEXPARG)
acc.tran[i][j] += exp(gamma);
                                                // endif (i==0 AND q==0)
                            } // endfor j
                        if (q<Q-1)
                                gamma = act_alfa[q][i]+ hmm.trans_mat[i]
[N-1]+beta[q][t][N-1]-pr;
                                if (gamma>MINEXPARG) acc.tran[i][N-1] +=
exp(gamma);
```

```
} // endfor i
                }
        else{
                if (q==Q-1)
                    for (i=1; i< N-1; i++)
                                gamma = act_alfa[q][i]+beta[q][t][i]-pr;
                                if (gamma>MINEXPARG) acc.tran[i][N-1] +=
exp(gamma);
                        }
                }
        return;
        }
// UpOccCount: update the occupation counters of given acc
void ModelsSimultaneousTraining::Update_Occourrence_Counter
(StatisticsAccumulators& acc,
const t_index t, const t_index q, const t_real pr)
    t_index i,N;
    t_real gamma;
        N = acc.occ.Dim();
      if (q==0)
                if (t==0) acc.occ[0]+=1;
    else{
                gamma = act_alfa[q][0]+beta[q][t][0]-pr;
                if (gamma>MINEXPARG) acc.occ[0] += exp(gamma);
                for (i=1; i< N-1; i++)
                        {
                        gamma = act_alfa[q][i]+beta[q][t][i]-pr;
                        if (gamma>MINEXPARG) acc.occ[i] += exp(gamma);
                }
                }
        return;
        }
           ----- Model Update ------
```

```
void ModelsSimultaneousTraining::Update_Model(EmbCodebook& hmm,
StatisticsAccumulators& acc)
        t_index i, j, k, kk, m, N, obs_size;
        t_real new_aij, new_mix_weight, new_var, occi,c_im,cfloor;
        VetDouble mean;
        MatrixOfDouble covariance;
        VetDouble mu_im,va_im_var,va_im_inv_k;
        MatrixOfDouble va_im_inv;
        cfloor = MINMIX;
        N = hmm.num\_states;
        if (reest_transitions)
                {
                hmm.trans_mat.Set(LOGZERO);
                for (i=0;i<N-1;i++)
                        occi = acc.occ[i];
                         if (occi > 0.0)
                                 for (j=1; j<N; j++)
                                         {
                                         new_aij = acc.tran[i][j]/occi;
                                         if(new_aij>MINLOGARG)
                                                 hmm.trans_mat[i][j] = log
(new_aij);
                                         else hmm.trans_mat[i][j] = LOGZERO;
                        else mwarn<<"Model "<<hmm.file<<" state "<<i<<"</pre>
never occupied.";
                         } // endfor i
                } // endif (reest_transitions)
        if (reest_means OR reest_variances OR reest_weights)
                // for each effective spectral state
                for (i=1; i< N-1; i++)
                         occi=acc.occ[i];
                        if (occi > 0.0)
                                 {
                                 M= hmm[i-1].Dim();
                                 // for each gaussian of i-th state
                                 for (m=0;m<M;m++)
                                         {
```

```
if (M==1)
                                                  c_im = occi;
                                          else c_im = acc.c[i][m];
                                          new_mix_weight = c_im/occi;
                                          if (reest_weights)
                                                  if (new_mix_weight > 1.0)
                                                          {
                                                          if (new_mix_weight
> 1.001)
                                                                  // this is
serious!
                                                                  mwarn<<"Mix</pre>
too big (new_mix_weight = "<<new_mix_weight
<<") in model n. "<<hmm.file<<" state "<<i
<<", mix "<<m;
new_mix_weight = 1.0;
                                                          }
                                                  if
(new_mix_weight<MINLOGARG)</pre>
                                                           hmm[i-1][m].weight
= LOGZERO;
                                                  else hmm[i-1][m].weight =
log(new_mix_weight);
                                                  }
                                          if (new_mix_weight >= cfloor)
                                                  if (reest_means)
                                                          hmm[i-1][m].mean =
acc.mu[i][m]/(t_real)c_im;
                                                  if (reest_variances)
                                                          {
                                                          if (!
hmm.full_covariance)
                                                                   obs_size =
hmm[i-1][m].diag_inv_cov.Dim();
                                                                   for
(k=0;k<obs_size;k++)
                                                                           {
```

```
new_var = acc.diag_va[i][m][k]/c_im;
                                                                          if
(new_var > min_var_value)
        hmm[i-1][m].diag_inv_cov[k][k]= new_var;
else hmm[i-1][m].diag_inv_cov[k][k]= const_to_add_min_var+new_var;
                                                                          }
        // endfork
                                                                 }
                                                         else{
                                                                 obs_size =
hmm[i-1][m].inv_cov.Dim();
                                                                  for
(k=0;k<obs_size;k++)
                                                                          for
(kk=k;kk<obs_size;kk++)
        {
        new_var = acc.full_cov[i][m][k][kk]/c_im;
        if(k == kk AND new_var < min_var_value)</pre>
                        new_var = min_var_value;
        hmm[i-1][m].inv\_cov[k][kk]
                        = hmm[i-1][m].inv\_cov[kk][k] = new\_var;
        }
                                                         if(!hmm[i-1]
[m].Compute_G_Const())
mwarn<<"Invalid inverse matrix in file: "<<hmm.file
                                                                       <<"
state: "<<i<" gauss: "<<m;
                                                         } // endif
(reest_variances)
                                                 } // endif (new_mix_weight
>= cfloor)
                                         } // endfor m
                                 } // endif (occi>0)
                         else mwarn<<"Model "<< hmm.file <<" state" << i<< "
```

```
never occupied. \n";
                         } // end for i
                 } //endif (reest_means OR reest_variances OR
reest_mixtures)
        return;
        }
// ***********
                           UPDATE MODELS
void ModelsSimultaneousTraining::Store_Statistic_Accs(const String&
accs_file)
        t_index i,j,h,k,z,Nh,Mh;
        t_index obs_size;
    ofstream file;
        file.open(accs_file);
        file.precision(OUTPUT_SIZE);
        for(h=0;h<HMM_accs.Dim();h++)</pre>
                 Nh=HMM_accs[h].num_states;
                 Mh=HMM_accs[h].num_mixes;
                 file<<"file: "<<h<<"\n\n";
             file<<"num_istances= "<<HMM_accs[h].num_istances<<"\n";</pre>
                 file<<"num_states= "<<Nh<<"\n";</pre>
                 file<<"num_mixes= "<<Mh<<"\n\n";</pre>
                 file<<"tran:\n";</pre>
                 for(i=0;i<Nh-1;i++)
                          {
                          for(j=1;j<Nh;j++)
                    file<<HMM_accs[h].tran[i][j]<<" ";</pre>
                          file<<"\n";
                          }
                 file<<"\nocc: ";</pre>
                 for(i=0;i<Nh-1;i++)
                          file<<HMM_accs[h].occ[i]<<" ";</pre>
             obs_size=HMM_accs[h].mu[0][0].Dim();
```

```
file<<"\n\nmu:\n";</pre>
                  for(i=1;i<Nh-1;i++)
                            for(j=0;j<Mh;j++)
                                     for(k=0;k<obs_size;k++)</pre>
                                              file<<HMM_accs[h].mu[i][j][k]<<" ";</pre>
                                     file<<"\n";
                                     }
                  if(HMM_accs[h].full_cov.Dim()!=0)
                            file<<"\nfull_cov: \n";</pre>
                            for(i=1;i<Nh-1;i++)
                                for(j=0;j<Mh;j++)
                                for(k=0;k<obs_size;k++)</pre>
                                                       for(z=k;z<obs_size;z++)</pre>
                                                                 file<<HMM_accs
[h].full_cov[i][j][k][z]<<" ";  '</pre>
                                                       file<<"\n";</pre>
                                                       }
                            }
                  else{
                            file<<"\n\ndiag_va: \n";</pre>
                       for(i=1;i<Nh-1;i++)
                            for(j=0;j<Mh;j++)</pre>
                            {
                                              for(k=0;k<obs_size;k++)</pre>
                                                        file<<HMM_accs[h].diag_va
[i][j][k]<<" ";
                            file<<"\n";
                            }
                  }
                  file<<"\nc: \n";</pre>
                  for(i=1;i<Nh-1;i++)
                            for(j=0;j<Mh;j++)
                                     file<<HMM_accs[h].c[i][j]<<" ";</pre>
                            file<<"\n";
                  file<<"\n";
                  }
         file.close();
         return;
```

```
}
void ModelsSimultaneousTraining::Load_Models_Parameters()
        t_index symbol, num_symbols;
        t_index vec_size;
        String buffer;
        Boolean use_full_cov;
        ifstream init_spcf;
        init_spcf.open(models_file_input, ios::inlios::nocreate);
        Read_Data_File_Header (init_spcf, vec_size, use_full_cov);
        if(features.Feature_Vet_Dim()!=vec_size)
                merr<<"Not compatible statistics dimension with initialized
acoustic models";
        Write_Header_Of_File_Model(models_file_output, dbase.Snd_Type(),
                dbase.Label_Type(), dbase.Db_File_List_Name(),
dbase.Window_Lenght(),
                dbase.Window_Overlap(), vec_size, use_full_cov);
        num_symbols = HMM_defs.Dim();
        HMM_accs.Destroy_And_ReDim(num_symbols);
        for(symbol=0; symbol<num_symbols; symbol++)</pre>
                HMM_defs[symbol].file=symbol;
                HMM_defs[symbol].stat_dim=vec_size;
                HMM_defs[symbol].full_covariance=use_full_cov;
                HMM_defs[symbol].Read(init_spcf, use_full_cov);
                HMM_accs[symbol].Configure(HMM_defs
[symbol].num_states,HMM_defs[symbol].num_gauss,
                                   vec_size, use_full_cov);
                }
        return;
        }
void ModelsSimultaneousTraining::Load_Statistic_Accs(const String&
accs_file)
        {
        t_index i,j,h,k,z,Nh,Mh;
        t_index obs_size, file;
```

```
ifstream file;
String buffer;
    t_real val;
    file.open(accs_file,ios::inlios::nocreate);
    if(file.fail())
            merr<<"Could not open file of statistics accumulators.";</pre>
    file.precision(OUTPUT_SIZE);
    for(h=0;h<HMM_accs.Dim();h++)</pre>
            file>>buffer;
            file>>file;
            Assert(file==h);
            file>>buffer;
            file>>HMM_accs[h].num_istances;
            file>>buffer;
            file>>Nh;
            file>>buffer;
            file>>Mh;
            file>>buffer;
            for(i=0;i<Nh-1;i++)
                     for(j=1;j<Nh;j++)
                              {
                              file>>val;
                             HMM_accs[h].tran[i][j]+=val;
            file>>buffer;
            for(i=0;i<Nh-1;i++)
                     {
                     file>>val;
                     HMM_accs[h].occ[i]+=val;
                     }
            obs_size=HMM_accs[h].mu[0][0].Dim();
        file>>buffer;
            for(i=1;i<Nh-1;i++)
                     for(j=0;j<Mh;j++)
                             for(k=0;k<obs_size;k++)</pre>
                                      file>>val;
                                      HMM_accs[h].mu[i][j][k]+=val;
                                      }
```

```
file>>buffer;
                 if(buffer=="full_cov:")
                          for(i=1;i<Nh-1;i++)
                                  for(j=0;j<Mh;j++)
                                          for(k=0;k<obs_size;k++)</pre>
                                                   for(z=k;z<obs_size;z++)</pre>
                                                            {
                                                            file>>val;
                                                           HMM_accs
[h].full_cov[i][j][k][z]+=val;
                                                           }
                 else for(i=1;i<Nh-1;i++)
                                  for(j=0;j<Mh;j++)</pre>
                                 for(k=0;k<obs_size;k++)</pre>
                                                   file>>val;
                                               HMM_accs[h].diag_va[i][j][k]
+=val;
                                                   }
                 file>>buffer;
                 for(i=1;i<Nh-1;i++)
                          for(j=0;j<Mh;j++)
                 {
                          file>>val;
                         HMM_accs[h].c[i][j]+=val;
                 }
        file.close();
        return;
        }
11
//
                         CLASS EmbNodeSpecShape
// MOutP: Returns prob of vector x for given state & given mixture
t_real EmbNodeSpecShape::Mix_Obs_LProb(const VetDouble& obs, const t_index
m)
```

```
{
        t_real prob;
        prob=(*this)[m].Evaluate_Exp_Gauss(obs);
        prob+=(*this)[m].gConst;
        return prob;
        }
// OutP: Returns probability (log) of vector x for given state
t_real EmbNodeSpecShape::Obs_LProb(const VetDouble& obs)
        {
        t_index m;
        t_real bx,px;
        bx = LOGZERO;
                                                 /* Multi Mixture Case */
        for (m=0; m<Dim(); m++)
                if ((*this)[m].weight>LMINMIX)
                        {
                        px =(*this)[m].Evaluate_Exp_Gauss(obs);
                        px += (*this)[m].gConst;
                        bx = LogAdd(bx, (*this)[m].weight + px);
                        }
                }
        return bx;
        }
```